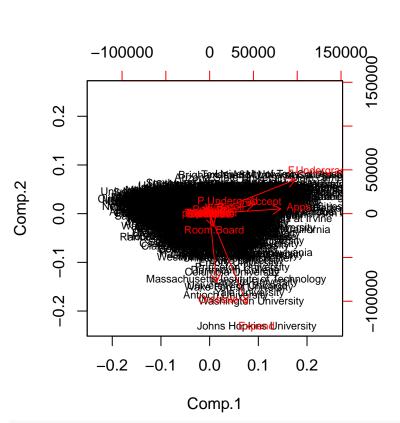
2021 SISBID Dimension Reduction Demo

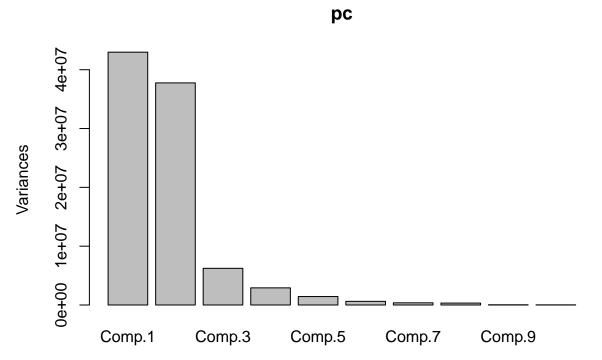
Genevera I. Allen, Yufeng Liu, Hui Shen, Camille Little

Quick PCA Demo Using College Data

```
Load in Packages
library(ISLR)
library(ggplot2)
## Warning: package 'ggplot2' was built under R version 3.6.2
library(GGally)
## Warning: package 'GGally' was built under R version 3.6.2
## Registered S3 method overwritten by 'GGally':
     method from
     +.gg
            ggplot2
Load Digits Data
#code for digits - ALL
rm(list=ls())
load("UnsupL_SISBID_2021.Rdata")
data(College)
cdat = College[,2:18]
dim(cdat)
## [1] 777 17
names(cdat)
                                                                 "Top25perc"
  [1] "Apps"
                      "Accept"
                                     "Enroll"
                                                   "Top10perc"
## [6] "F.Undergrad" "P.Undergrad" "Outstate"
                                                                 "Books"
                                                   "Room.Board"
## [11] "Personal"
                      "PhD"
                                     "Terminal"
                                                   "S.F.Ratio"
                                                                 "perc.alumni"
## [16] "Expend"
                      "Grad.Rate"
pc = princomp(cdat) #default - centers and scales
#Go back and display these plots side by side
biplot(pc,cex=.7)
## Warning in arrows(0, 0, y[, 1L] * 0.8, y[, 2L] * 0.8, col = col[2L], length =
## arrow.len): zero-length arrow is of indeterminate angle and so skipped
```



screeplot(pc)



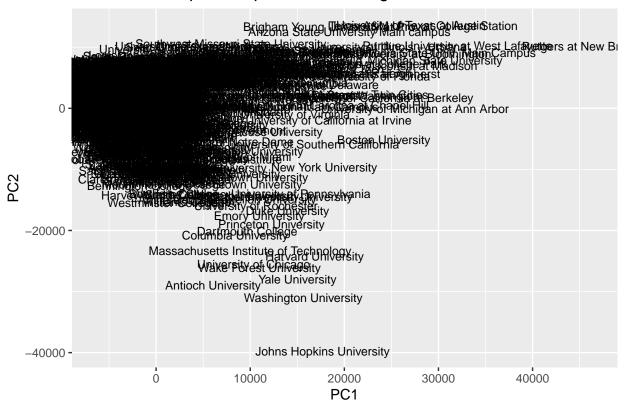
scatter plots - patterns among observations

```
PC1 <- as.matrix(x=pc$scores[,1])
PC2 <- as.matrix(pc$scores[,2])

PC <- data.frame(State = row.names(cdat), PC1, PC2)
ggplot(PC, aes(PC1, PC2)) +</pre>
```

```
geom_text(aes(label = State), size = 3) +
xlab("PC1") +
ylab("PC2") +
ggtitle("First Two Principal Components of College Data")
```

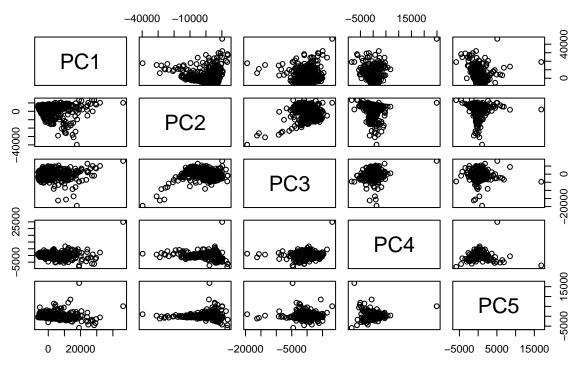
First Two Principal Components of College Data



Pairs Plot

```
comp_labels<-c("PC1","PC2","PC3","PC4", "PC5")
pairs(pc$scores[,1:5], labels = comp_labels, main = "Pairs of PC's for College Data")</pre>
```

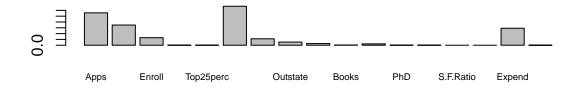
Pairs of PC's for College Data



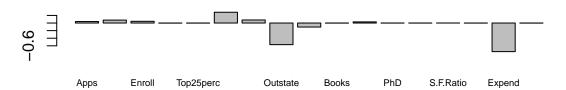
Loadings - variables that contribute to these patterns

```
par(mfrow=c(2,1))
barplot(pc$loadings[,1],cex.names=.6,main="PC 1 Loadings")
barplot(pc$loadings[,2],cex.names=.6,main="PC 2 Loadings")
```

PC 1 Loadings



PC 2 Loadings

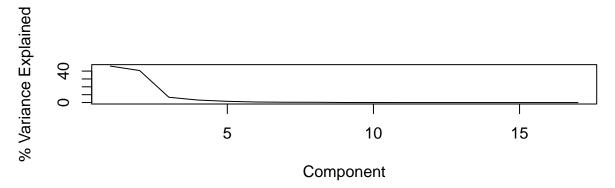


Variance explained

```
varex = 100*pc$sdev^2/sum(pc$sdev^2)
par(mfrow=c(2,1))
screeplot(pc)
plot(varex,type="1",ylab="% Variance Explained",xlab="Component")

pc

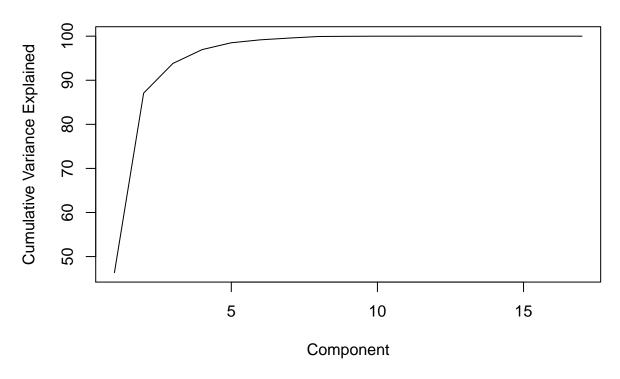
Comp.1 Comp.3 Comp.5 Comp.7 Comp.9
```



Cumulative variance explained

```
#cumulative variance explained
cvarex = NULL
for(i in 1:ncol(cdat)){
   cvarex[i] = sum(varex[1:i])
}
plot(cvarex,type="l",ylab="Cumulative Variance Explained",xlab="Component", main = "Principal Component")
```

Principal Component V. Variance Explained



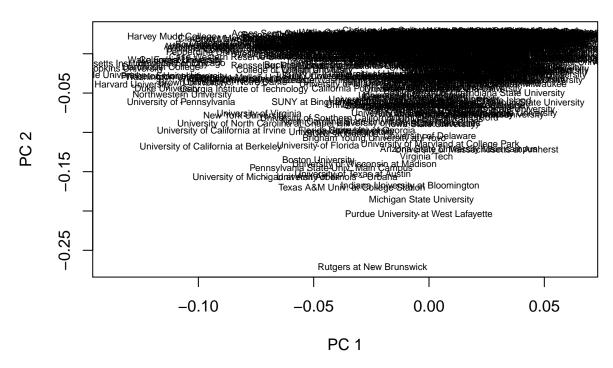
Sparse PCA

```
library(PMA)
spc = SPC(scale(cdat), sumabsv=2, K=3)

## 1234567891011121314151617181920
## 1234567891011121314151617181920
spcL = spc$v
rownames(spcL) = names(cdat)

Scatterplots of Sparse PCs
i = 1; j = 2;
plot(spc$u[,i],spc$u[,j],pch=16,cex=.2, xlab = "PC 1", ylab = "PC 2", main = "Scatterplot of Sparse PC'text(spc$u[,i],spc$u[,j],rownames(cdat),cex=.6)
```

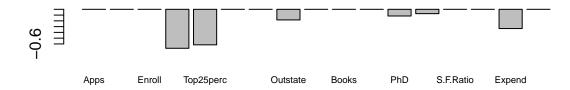
Scatterplot of Sparse PC's



Loadings

```
par(mfrow=c(2,1))
barplot(spc$v[,1],names=names(cdat),cex.names=.6,main="SPC 1 Loadings")
barplot(spc$v[,2],names=names(cdat),cex.names=.6,main="SPC 2 Loadings")
```

SPC 1 Loadings



SPC 2 Loadings



Try Princomp Function for Digits 3 and 8

```
dat38 = rbind(digits[which(rownames(digits)==3),],digits[which(rownames(digits)==8),])
pc = princomp(dat38) #default - centers and scales
Pairs plot Using ggpairs
PC1 <- as.matrix(x=pc$scores[,1])</pre>
PC2 <- as.matrix(pc$scores[,2])</pre>
PC3 <- as.matrix(pc\$scores[,3])
PC4 <- as.matrix(pc\$scores[,4])
PC5<-as.matrix(pc$scores[,5])</pre>
pc.df.digits <- data.frame(digit_name = row.names(dat38), PC1, PC2,PC3, PC4, PC5)
ggpairs(pc.df.digits, mapping = aes(color = digit_name))
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
## `stat bin()` using `bins = 30`. Pick better value with `binwidth`.
      digit_name
                       PC1
                                      PC2
                                                    PC3
                                                                   PC4
                                                                                  PC5
800 -
600 -
400 -
200 -
  0 -
 1Ŏ-
                                                              Corr: -0.000
                                                                             Corr: -0.000
                                 Corr: -0.000
                                                Corr: -0.000
  5 -
                                                                                           PC1
                                  3: 0.451***
                                                 3: 0.276***
                                                                3: -0.056
                                                                              3: 0.023
  0
                                  8: 0.384***
                                                 8: 0.111**
                                                                8: 0.102**
                                                                             8: -0.275***
 -5
 10 -
                                                Corr: -0.000
                                                               Corr: 0.000
                                                                              Corr: 0.000
  5
                                                                              3: 0.145***
                                                 3: -0.039
                                                               3: -0.289***
  0
                                                                             8: -0.134***
                                                 8: -0.074*
                                                               8: 0.249***
 -5 -
  8 -
                                                              Corr: -0.000
                                                                              Corr: 0.000
  4 -
                                                               3: -0.261***
                                                                               3:-0.006
  0 -
                                                               8: 0.333***
 -4
                                                                               8: 0.044
  8 -
                                                                              Corr: 0.000
                                                                               3: -0.023
  0
                                                                               8: 0.036
  5 -
                                                                                           PC5
  0
    0204060 0204060
                              10 -5 0 5 10
                           5
                   -5 0
                                                  -4 0 4
                                                                   0
PC Loadings
par(mfrow=c(3,5),mar=c(.1,.1,.1,.1))
for(i in 1:15){
  imagedigit(pc$loadings[,i])
```

